

## Lu.Getz.Miska\_Nature.June.2005.mouse.lung

**Module name:** Lu.Getz.Miska\_Nature.June.2005.mouse.lung  
**Description:** Normal/tumor classifier and *k*NN prediction of mouse lung samples  
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### Summary

The following description of the analysis is from the supplementary material ([http://www.broad.mit.edu/mpr/publications/projects/microRNA/Supplementary\\_Notes.pdf](http://www.broad.mit.edu/mpr/publications/projects/microRNA/Supplementary_Notes.pdf)) of the paper (1):

### Normal/tumor classifier and *k*NN prediction of mouse lung samples

In order to build a classifier of normal samples vs. tumor samples based on the miGCM collection, we first picked tissues that have enough normal and tumor samples (at least 3 in each class). The following list summarizes the tissues for this analysis.

**Table: Number of Training Samples Used to Build the Normal/Tumor Classifier**

| Tissue   | Number of Normal | Number of Tumor |
|----------|------------------|-----------------|
| Colon    | 5                | 10              |
| Kidney   | 3                | 5               |
| Prostate | 8                | 6               |
| Uterus   | 9                | 10              |
| Lung     | 4                | 6               |
| Breast   | 3                | 6               |

*k*NN<sup>11</sup> is a predicting algorithm that learns from a training data set (in this case, the above samples from the miGCM data set) and predicts samples in a test data set (in this case, the mouse lung sample set). A set of markers (features that best distinguishes two classes of samples, in this case, normal vs. tumor) was selected using the training data set. Distances between the samples were measured in the space of the selected markers. Prediction is performed, one test sample at a time, by: (i), identifying the *k* nearest samples (neighbors) of the test sample among the training data set; and (ii) assigning the test sample to the majority class of these *k* samples.

We first selected markers that best differentiate the normal and tumor samples (see Supplementary Methods) out of the 187 features that passed the filter (which was applied on the training set alone). This generated a list of 131 markers that each has a p-value <0.05 after Bonferroni correction; 129/131 markers are over-expressed in normal samples, whereas 2/131 are over-expressed in the tumor samples. The following table lists these markers.

**Table: Normal/Tumor Markers Selected On the Training Set**

| Probe  | Description  | Bonferroni-corrected p-value | Variance-thresholded t-test score |
|--------|--------------|------------------------------|-----------------------------------|
| EAM159 | hmr_miR-130a | 0                            | 10.984                            |
| EAM331 | hmr_miR-30e  | 0                            | 10.756                            |
| EAM311 | hmr_miR-101  | 0                            | 10.392                            |
| EAM299 | hmr_miR-195  | 0                            | 9.957                             |
| EAM314 | hmr_miR-126  | 0                            | 9.498                             |
| EAM300 | h_miR-197    | 0                            | 8.762                             |
| EAM181 | hmr_let-7f   | 0                            | 8.299                             |
| EAM380 | r_miR-140*   | 0                            | 8.238                             |

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|--------|----------------|---|-------|
| EAM111 | hm_let-7g      | 0 | 8.235 |
| EAM381 | r_miR-151*     | 0 | 8.198 |
| EAM218 | hmr_miR-152    | 0 | 8.180 |
| EAM183 | hmr_let-7i     | 0 | 8.098 |
| EAM253 | hmr_miR-218    | 0 | 8.077 |
| EAM155 | hmr_miR-136    | 0 | 8.058 |
| EAM192 | hmr_miR-126*   | 0 | 7.991 |
| EAM222 | hm_miR-15a     | 0 | 7.970 |
| EAM161 | hmr_miR-28     | 0 | 7.949 |
| EAM184 | hmr_miR-100    | 0 | 7.894 |
| EAM271 | hmr_miR-30c    | 0 | 7.848 |
| EAM270 | hmr_miR-30b    | 0 | 7.731 |
| EAM303 | hm_miR-199a*   | 0 | 7.519 |
| EAM121 | hmr_miR-99a    | 0 | 7.515 |
| EAM392 | r_miR-352      | 0 | 7.476 |
| EAM255 | hmr_miR-22     | 0 | 7.465 |
| EAM249 | hmr_miR-214    | 0 | 7.338 |
| EAM160 | hmr_miR-26b    | 0 | 7.313 |
| EAM133 | hmr_miR-324-5p | 0 | 7.266 |
| EAM238 | hm_miR-1       | 0 | 7.259 |
| EAM179 | hmr_let-7d     | 0 | 7.235 |
| EAM339 | hmr_miR-99b    | 0 | 7.225 |
| EAM185 | hmr_miR-103    | 0 | 7.047 |
| EAM168 | hmr_let-7e     | 0 | 7.034 |
| EAM200 | hmr_miR-133a   | 0 | 6.959 |
| EAM278 | hmr_miR-98     | 0 | 6.952 |
| EAM333 | hmr_miR-32     | 0 | 6.951 |
| EAM291 | hmr_miR-185    | 0 | 6.910 |
| EAM187 | hmr_miR-107    | 0 | 6.879 |
| EAM263 | hmr_miR-26a    | 0 | 6.818 |
| EAM261 | hmr_miR-23b    | 0 | 6.814 |
| EAM371 | hmr_miR-342    | 0 | 6.743 |
| EAM330 | hmr_miR-30a-5p | 0 | 6.717 |
| EAM280 | hmr_miR-30a-3p | 0 | 6.662 |
| EAM233 | hmr_miR-196a   | 0 | 6.630 |
| EAM292 | hmr_miR-186    | 0 | 6.602 |
| EAM115 | hmr_miR-16     | 0 | 6.558 |
| EAM272 | hmr_miR-30d    | 0 | 6.516 |
| EAM367 | hmr_miR-338    | 0 | 6.428 |
| EAM379 | r_miR-129*     | 0 | 6.323 |
| EAM193 | hmr_miR-125a   | 0 | 6.222 |
| EAM273 | hmr_miR-33     | 0 | 6.209 |
| EAM223 | hmr_miR-15b    | 0 | 6.148 |
| EAM105 | hmr_miR-125b   | 0 | 6.111 |
| EAM385 | hmr_miR-335    | 0 | 6.011 |
| EAM237 | hmr_miR-19b    | 0 | 5.981 |
| EAM320 | hm_miR-189     | 0 | 5.938 |
| EAM262 | hmr_miR-24     | 0 | 5.909 |

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|        |                |   |       |
|--------|----------------|---|-------|
| EAM240 | hmr_miR-20     | 0 | 5.908 |
| EAM260 | hmr_miR-23a    | 0 | 5.901 |
| EAM297 | hmr_miR-193    | 0 | 5.856 |
| EAM236 | hmr_miR-19a    | 0 | 5.789 |
| EAM264 | hmr_miR-27b    | 0 | 5.780 |
| EAM205 | hmr_miR-138    | 0 | 5.721 |
| EAM234 | hmr_miR-199a   | 0 | 5.718 |
| EAM207 | hmr_miR-140    | 0 | 5.561 |
| EAM217 | hmr_miR-150    | 0 | 5.531 |
| EAM235 | h_miR-199b     | 0 | 5.516 |
| EAM190 | hr_miR-10b     | 0 | 5.511 |
| EAM282 | m_miR-199b     | 0 | 5.483 |
| EAM335 | h_miR-34b      | 0 | 5.315 |
| EAM288 | m_miR-10b      | 0 | 5.291 |
| EAM275 | hmr_miR-34a    | 0 | 5.287 |
| EAM195 | hmr_miR-128b   | 0 | 5.253 |
| EAM328 | hmr_miR-301    | 0 | 5.203 |
| EAM365 | hmr_miR-331    | 0 | 5.191 |
| EAM131 | hmr_miR-92     | 0 | 5.155 |
| EAM215 | hmr_miR-148b   | 0 | 5.091 |
| EAM325 | hmr_miR-27a    | 0 | 5.090 |
| EAM279 | hmr_miR-29c    | 0 | 5.025 |
| EAM369 | hmr_miR-340    | 0 | 4.959 |
| EAM354 | m_miR-297      | 0 | 4.953 |
| EAM119 | hmr_miR-29b    | 0 | 4.937 |
| EAM210 | hmr_miR-143    | 0 | 4.908 |
| EAM361 | hmr_miR-326    | 0 | 4.790 |
| EAM324 | hmr_miR-25     | 0 | 4.764 |
| EAM226 | hmr_miR-181a   | 0 | 4.742 |
| EAM343 | mr_miR-151     | 0 | 4.740 |
| EAM228 | hmr_miR-181c   | 0 | 4.675 |
| EAM366 | mr_miR-337     | 0 | 4.661 |
| EAM349 | mr_miR-292-3p  | 0 | 4.652 |
| EAM189 | hmr_miR-10a    | 0 | 4.494 |
| EAM355 | mr_miR-298     | 0 | 4.446 |
| EAM318 | h_miR-17-3p    | 0 | 4.324 |
| EAM387 | r_miR-343      | 0 | 4.140 |
| EAM363 | mr_miR-329     | 0 | 4.118 |
| EAM268 | hmr_miR-29a    | 0 | 4.044 |
| EAM175 | hmr_miR-320    | 0 | 3.875 |
| EAM212 | hmr_miR-145    | 0 | 3.869 |
| EAM378 | mr_miR-7b      | 0 | 3.853 |
| EAM281 | mr_miR-217     | 0 | 3.670 |
| EAM307 | m_miR-202      | 0 | 3.625 |
| EAM209 | hmr_miR-142-5p | 0 | 3.594 |
| EAM163 | hmr_miR-142-3p | 0 | 3.545 |
| EAM384 | r_miR-333      | 0 | 3.410 |
| EAM362 | hmr_miR-328    | 0 | 3.356 |

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|--------|---------------|-------|--------|
| EAM329 | hm_miR-302a   | 0     | 3.348  |
| EAM368 | hmr_miR-339   | 0     | 3.007  |
| EAM351 | m_miR-293     | 0     | 2.852  |
| EAM153 | hmr_let-7a    | 0     | 2.818  |
| EAM360 | mr_miR-325    | 0     | 2.753  |
| EAM145 | hmr_let-7c    | 0     | 2.393  |
| EAM348 | mr_miR-291-5p | 0     | 2.092  |
| EAM298 | hmr_miR-194   | 0     | 2.068  |
| EAM250 | h_miR-215     | 0     | 1.746  |
| EAM229 | hm_miR-182    | 0.005 | -4.074 |
| EAM224 | hmr_miR-17-5p | 0.005 | 4.875  |
| EAM341 | m_miR-106a    | 0.005 | 4.185  |
| EAM242 | hmr_miR-204   | 0.005 | 3.457  |
| EAM295 | hmr_miR-190   | 0.005 | 3.186  |
| EAM353 | m_miR-295     | 0.005 | 2.916  |
| EAM246 | h_miR-211     | 0.005 | 2.663  |
| EAM248 | hmr_miR-213   | 0.01  | 3.369  |
| EAM186 | h_miR-106a    | 0.01  | 4.650  |
| EAM137 | hmr_miR-132   | 0.01  | 3.388  |
| EAM258 | hmr_miR-222   | 0.015 | 4.257  |
| EAM230 | hmr_miR-183   | 0.02  | -3.977 |
| EAM364 | mr_miR-330    | 0.02  | 3.982  |
| EAM206 | hmr_miR-139   | 0.02  | 3.761  |
| EAM327 | hmr_miR-299   | 0.025 | 2.353  |
| EAM232 | hmr_miR-192   | 0.04  | 1.065  |
| EAM257 | hmr_miR-221   | 0.04  | 4.321  |
| EAM216 | hm_miR-149    | 0.04  | 3.711  |

These 131 markers were used without modification to predict the 12 mouse lung samples using the  $k$ -nearest neighbour algorithm. Each mouse sample was predicted separately, using  $\log_2$  transformed mouse and human expression data. The tumor/normal phenotype prediction of a mouse sample was based on the majority type of the  $k$  nearest human samples using the chosen metric in the selected feature space. Since the tumor/normal distinction was observed at the raw miRNA expression levels, we decided to use Euclidean distance to measure the distances between samples. Thus, we performed  $k$ NN with the Euclidean distance measure and  $k=3$ , resulting in 100% accuracy. The detailed prediction results are available in Supplementary Table 3. Similar classification results were obtained with other  $k$ NN parameters, with the exception of one mouse tumor T\_MLUNG\_5 (3rd column from right in Fig. 3b). This sample was occasionally classified as normal, for example, when using cosine distance measure ( $k=3$ ). It should be pointed out that cosine distance captures less an overall shift in expression levels compared to Euclidean distance. It rather focuses on comparing the relationships among the different miRNAs So it appears that the same miRNA data capture different information with different distance metrics; Pearson correlation captures information about the lineage (as seen in clustering results), and Euclidean distance captures the normal/tumor distinction.

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## References:

- Lu, Getz, Miska, et al. "MicroRNA Expression Profiles Classify Human Cancers," Nature 435, 834-838 (9 June 2005)